

# ABoVE

## Carbon Dynamics Working Group



Abhishek Chatterjee, S. Natali, R. Commane (co-chairs)

E. Larson, Z. Liu, B. Poulter, B. Rogers, L. Schiferl, C. Sweeney, K. Turner, J. Watts, Z. Zhang, et al.

ABoVE Science Team Meeting

La Jolla, May 21, 2019

## Outline

- ❑ ABoVE Carbon Dynamics WG
- ❑ Carbon cycle legacy in BOREAS
- ❑ Outstanding carbon cycle Questions  
(pooled from various projects and their goals)
- ❑ Project Updates

## ABoVE Projects with CD Component

### Primary Discipline:

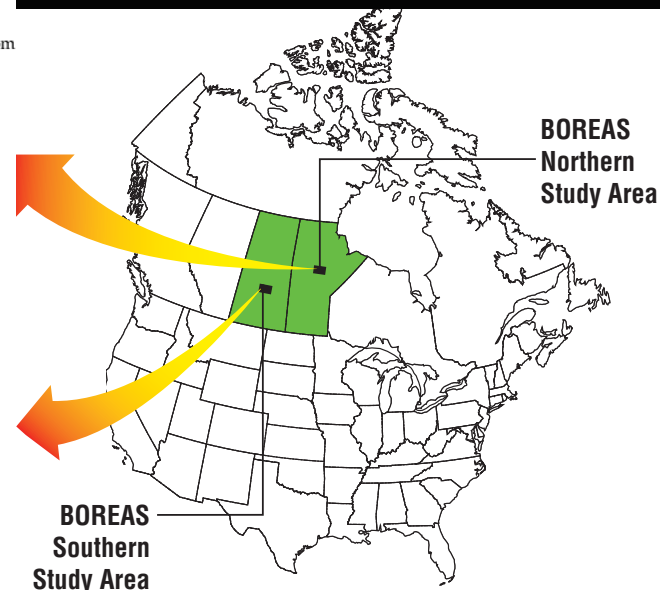
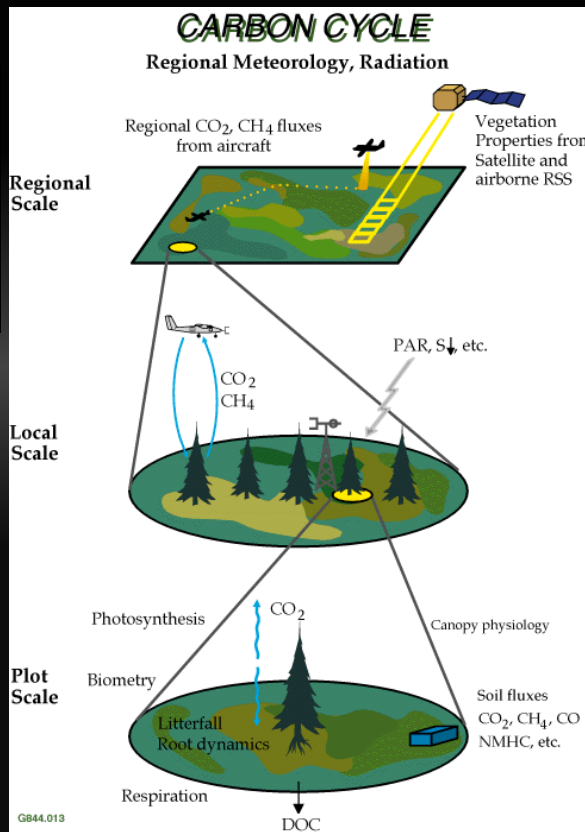
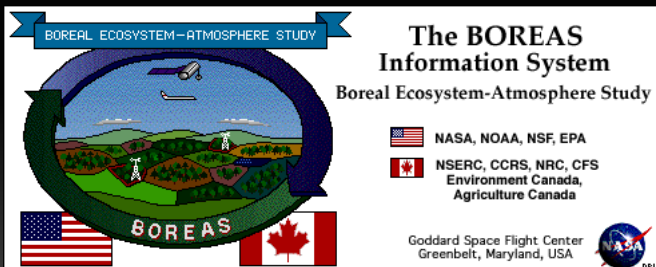
Abshire (2017)	Munger (CARBON 2016)
Byrne (NPP 2018)	Munger (TE 2012)
Gamon (TE 2014)	Natali (TE 2014)
Hu (TE 2018)	Neigh (CARBON 2016)
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### Secondary:

AAC Management	Marsh (2016)
Chatterjee (TE 2016)	McLennan (2015)
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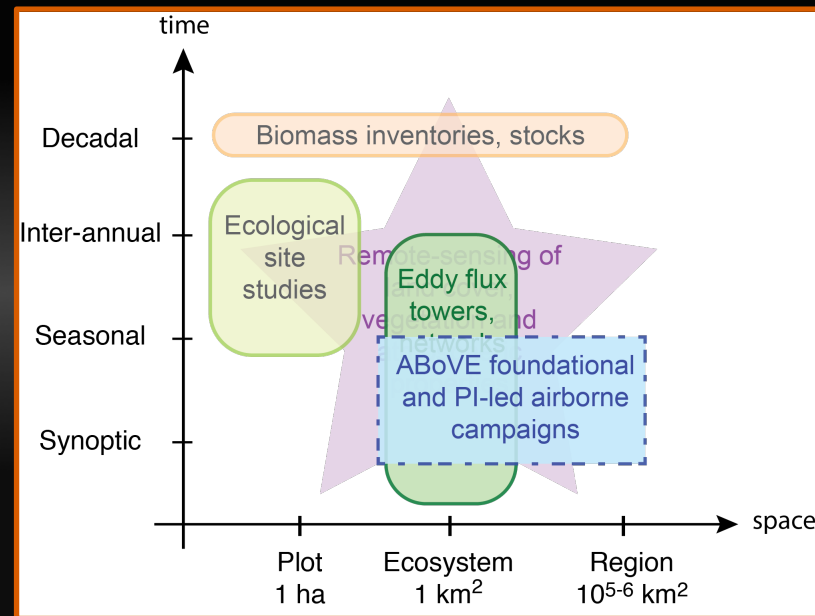


# The BOREAS legacy (1993-1996)



## Outstanding carbon cycle questions

- a) ABoVE (and Pan-Arctic) C budget
- b) Reconciliation of C budget between bottom-up and top-down approaches
- c) Seasonality and IAV in C fluxes, trends and future trajectories
- d) Individual process dynamics (vegetation, permafrost, hydrology, disturbance) and contribution to C fluxes
- e) Future natural and anthropogenic C emissions



## Recent Project Updates (as submitted by PIs and/or their teams)

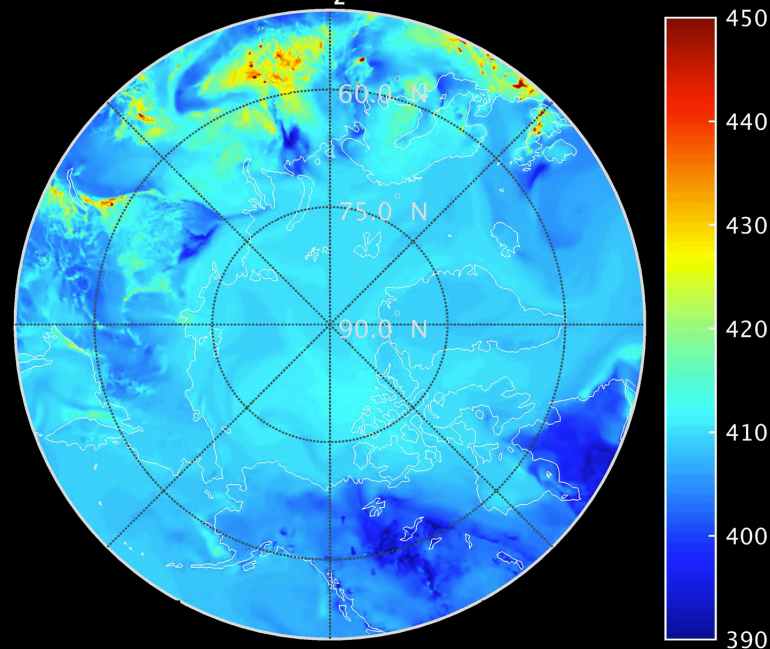
- ✓ modeling
  - large-scale concentrations & fluxes ... Chatterjee, Parazoo, Rogers
  - local scale ... Munger
- ✓ observations
  - aircraft ... Sweeney
  - flux towers ... Natali
- ✓ carbon-permafrost ... Turner

- Goal :

*Current ABoVE and Pan-Arctic C budget, RECCAP-2 tasks, Forecasting CO<sub>2</sub>/CH<sub>4</sub> emissions*

- GEOS-LPJ model - coupled land-ocean-atmosphere system running at  $\sim 12.5$  km -to-  $0.5^\circ$  that simulates carbon species simultaneously (CO<sub>2</sub>, CH<sub>4</sub>, CO)
- Modeling effort recognizes the Arctic as a tightly coupled system

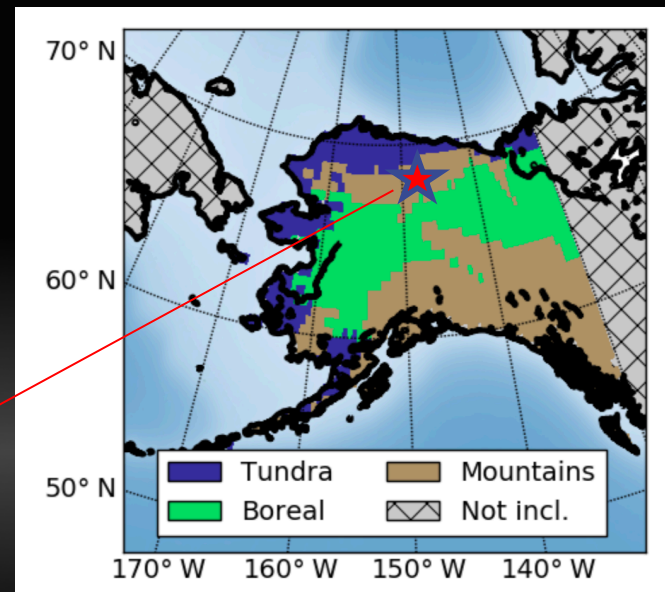
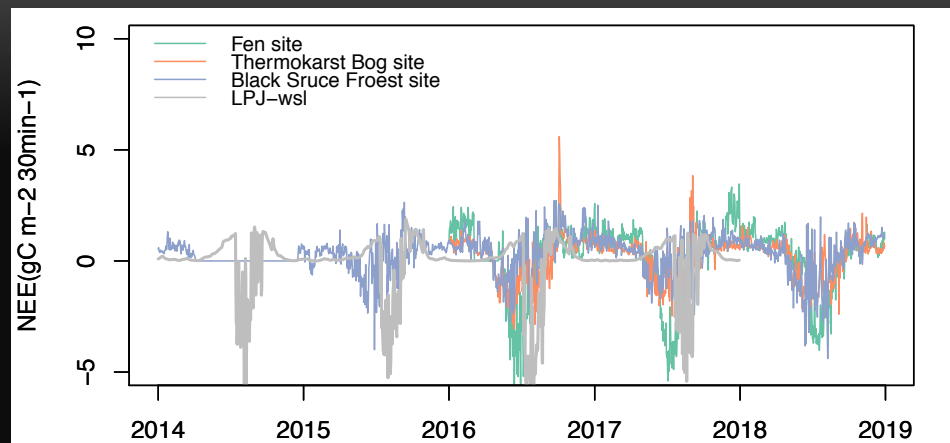
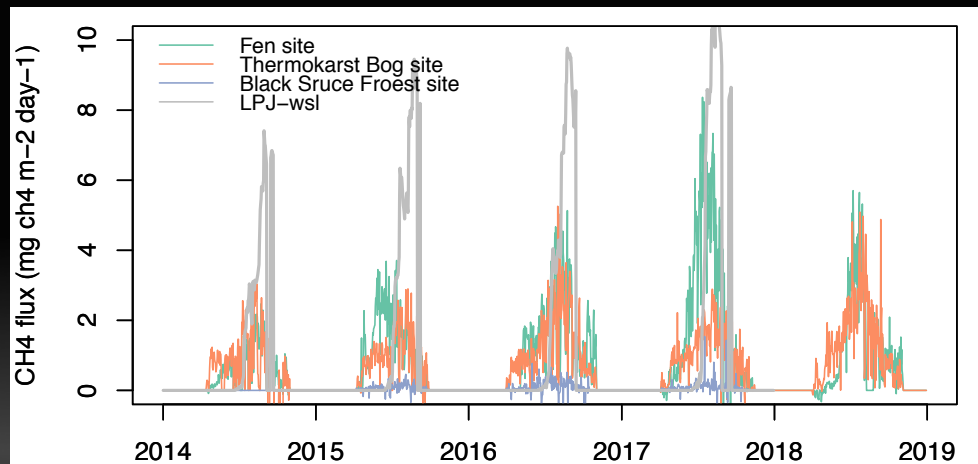
2017/06/01 00Z  
GEOS surface CO<sub>2</sub> (dry-air ppmv)



Global 12.5 km simulation for June 2017

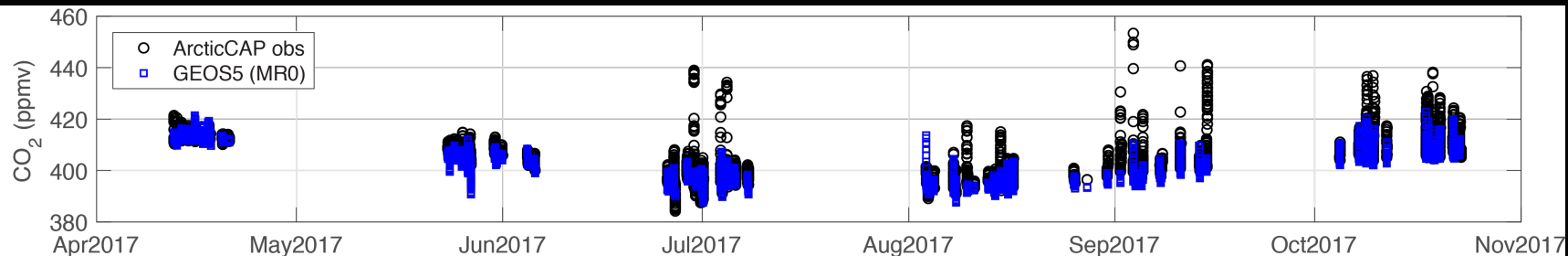
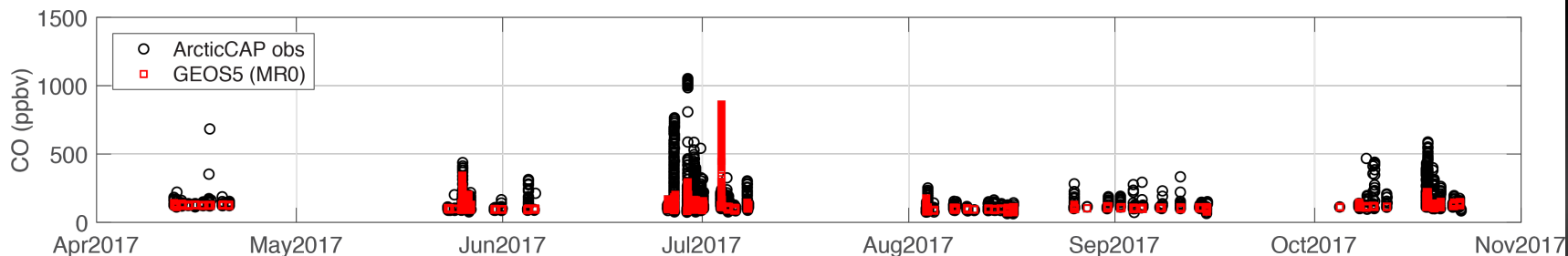
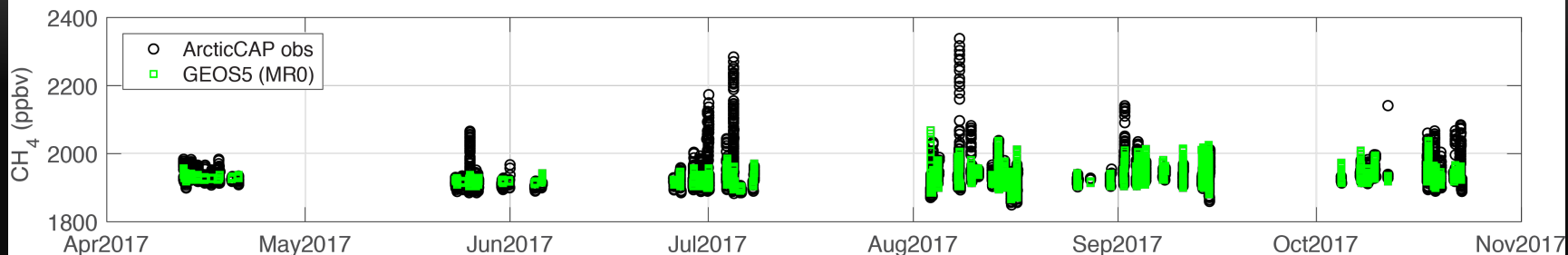
(Chatterjee -01) Abhishek Chatterjee, B. Poulter, J. Masek, L. Ott, C. Miller, E. Euskirchen

## Comparison with EC measurement at site level



Hartery et al., 2018

(Chatterjee - 01) Zhen Zhang, B. Poulter, E. Euskirchen, A. Chatterjee

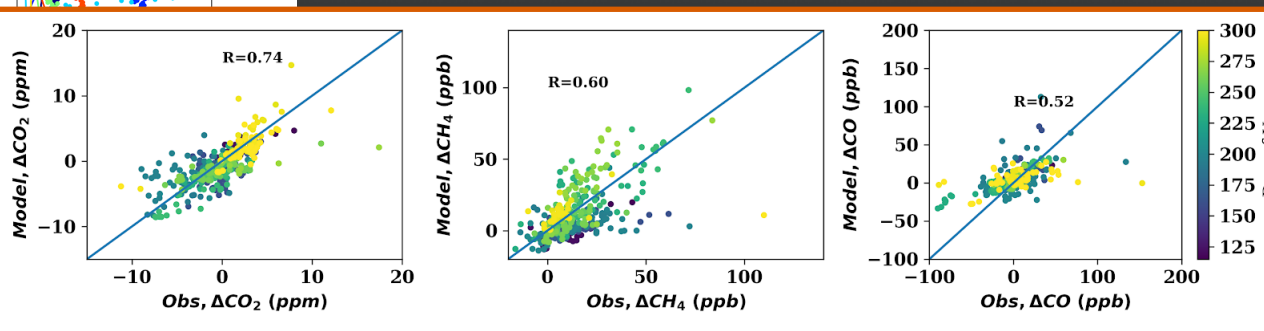
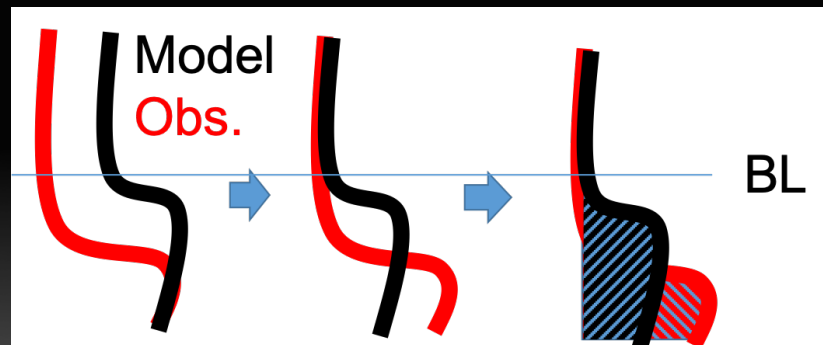
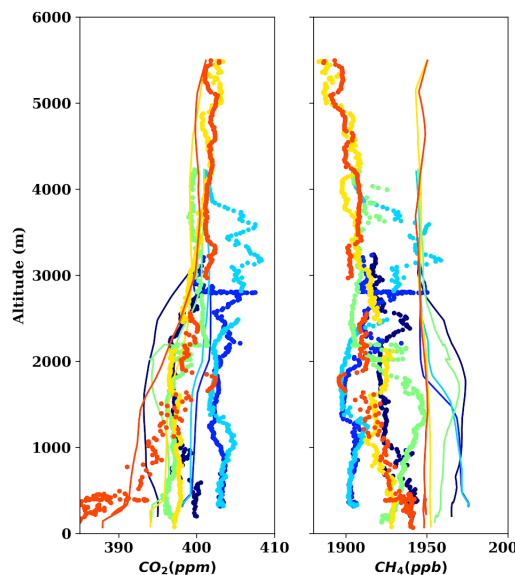
$\text{CO}_2$  $\text{CO}$  $\text{CH}_4$ 

(Chatterjee-01, Sweeney-01) also see Colm Sweeney's poster, paper in prep. for ERL



## A Tale of Three Carbon Species

July 10, 2017



(Chatterjee-01, Sweeney-01) also see Colm Sweeney's poster, paper in prep. for ERL

# Different seasonal compensation between productivity and net carbon uptake during warm spring year

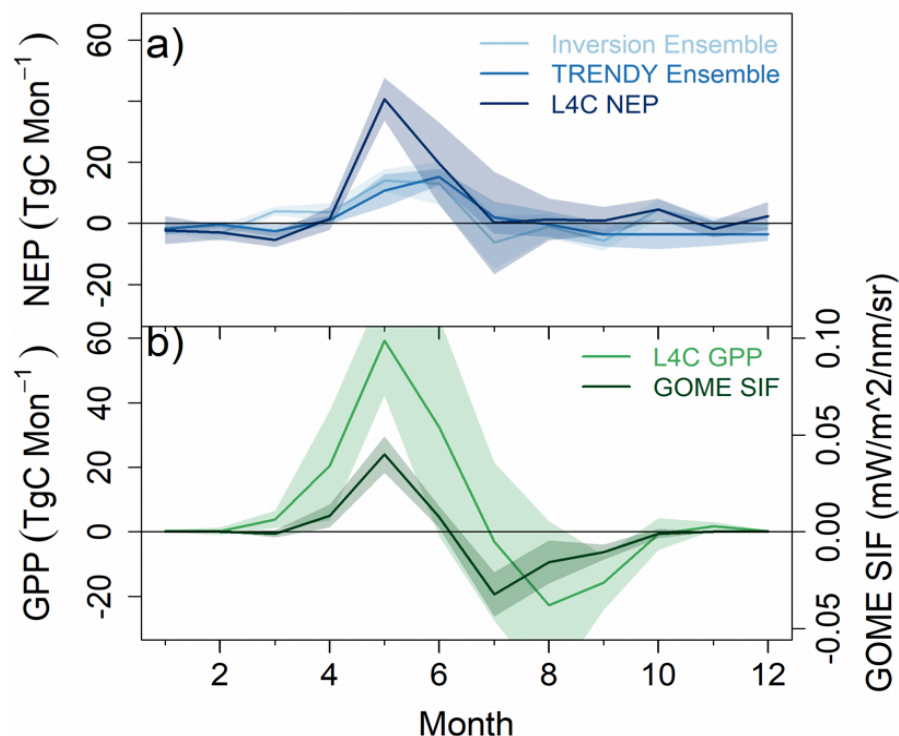


Figure 1. Seasonal carbon cycle anomaly across the ABoVE domain for a) net ecosystem production (NEP = GPP - TER), calculated as the difference between gross primary production (GPP) and terrestrial ecosystem respiration (TER); b) satellite based observations of ecosystem productivity represented by GPP from the NASA Soil Moisture Active Passive (SMAP) Level 4 Carbon (L4C) product, and solar-induced chlorophyll fluorescence (SIF) from the ESA GOME-2 sensor. The anomaly was calculated as difference between warm spring (2015/2016) and baseline (2010-2014) conditions. The inversion ensemble includes Carbon Tracker (CT2017), Carbon Tracker Europe (CTE2016), CAMS, Jena CarboScope (s76\_v4.2 and s85\_v4.2), and JAMSTEC. TRENDY ensemble includes CABLE, CLM4.5, JULES, LPJ, LPX, OCN, ORCHIDEE-MICT, and SDGVM using "S3" storyline that includes time-varying atmospheric CO<sub>2</sub> concentrations, climate, and land-cover changes and management. Shading denotes 1 spatial standard deviation (SD) from the regional monthly means within the ABoVE domain.

Liu et al., **Increased photosynthetic carbon gain offset by preceding respiration carbon loss in anomalously warm winter to spring transition at high latitude**, *submission for environmental research letters*.

## Contact:

Zhihua Liu ([Zhihua.liu@mso.umt.edu](mailto:Zhihua.liu@mso.umt.edu)), John Kimball ([John.Kimball@mso.umt.edu](mailto:John.Kimball@mso.umt.edu)), or Nick Parazoo ([nicholas.c.parazoo@jpl.nasa.gov](mailto:nicholas.c.parazoo@jpl.nasa.gov))

# Rogers 02 (CARBON 2016): Multi-scale assessments of changing seasonal CO<sub>2</sub> fluxes across the arctic-boreal zone

## Synthesis of *in situ* CO<sub>2</sub> fluxes

### Objective

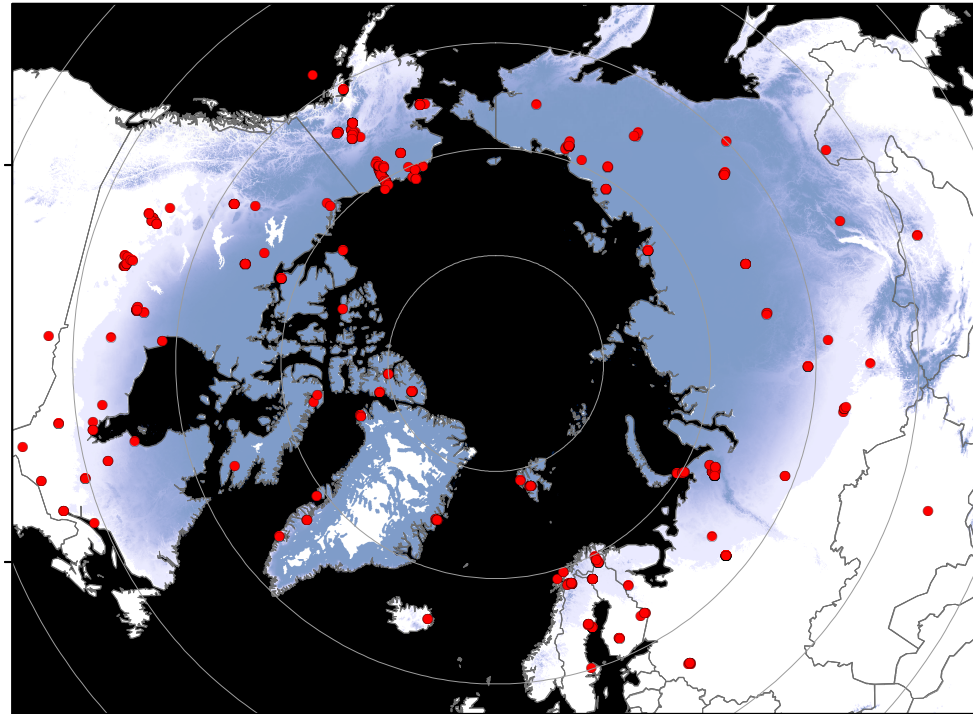
- Generate a new database and upscaled product for monthly CO<sub>2</sub> fluxes across the arctic-boreal zone
- Building on Natali et al. (*Nature Climate Change*, in review)

### Methodology

- Compile & synthesize available *in situ* observations from publications, flux repositories, and researcher contributions
- Upscale to circumpolar gridded monthly product using remote sensing & other geospatial data sets
- In partnership with broader community efforts (Arctic Data Center-sponsored workshops in 2018)

### Uses

- Assess spatial patterns and drivers of changing seasonal CO<sub>2</sub> fluxes and regional source / sink strengths



Field sites under consideration (work in progress). These represent both eddy covariance towers and chambers



High-latitude CO<sub>2</sub> flux workshop at NCEAS, Santa Barbara, CA, March 2018

# Rogers 02 (CARBON 2016): Multi-scale assessments of changing seasonal CO<sub>2</sub> fluxes across the arctic-boreal zone

## Prognostic land modeling (Community Land Model)

### Objective

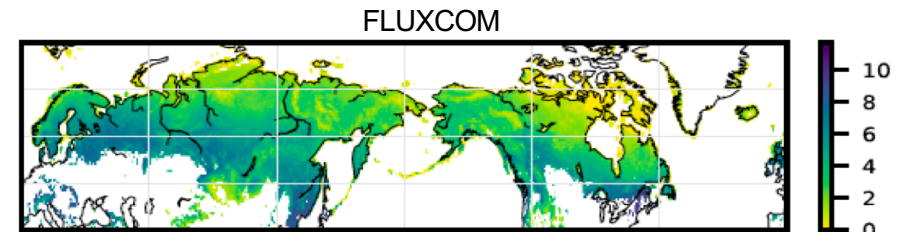
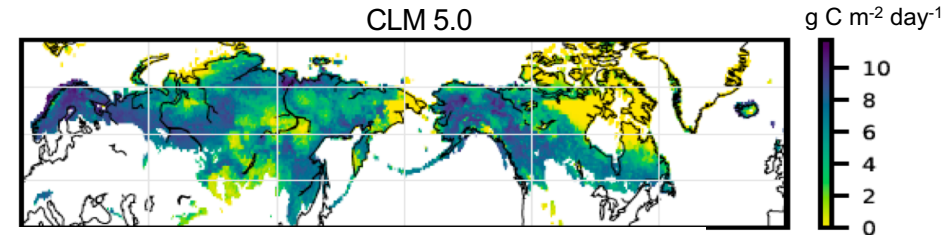
- Conduct a series of (NASA) data-driven model experiments to assess the underlying drivers of changing seasonal fluxes

### Methodology

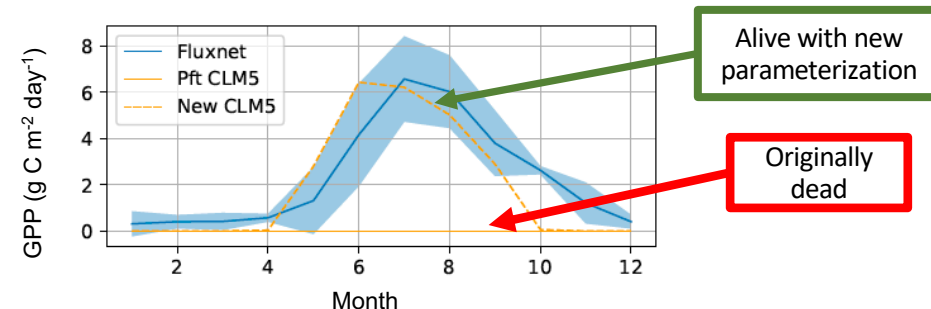
- Refine CLM to adequately represent high-latitude seasonal CO<sub>2</sub> fluxes, especially from individual Plant Functional Types (PFTs)
  - Focus on photosynthesis onset, offset, peak month, and magnitude
- Develop an experimental framework and drive historical simulations using gridded products (snow cover, vegetation properties, etc.)

### Status

- CLM 5.0 compared relatively poorly with observations
- We have made progress on new algorithms for spring and fall phenology, and are developing a parameter optimization framework for GPP magnitude (Birch et al., *in prep*)



Mean summer GPP from CLM and the widely-used FLUXCOM product (Jung et al., 2017)



Seasonal GPP from CLM (deciduous broadleaf PFT) compared to a flux tower in southern boreal Canada (CA-QC2)

# Rogers 02 (CARBON 2016): Multi-scale assessments of changing seasonal CO<sub>2</sub> fluxes across the arctic-boreal zone

## Atmospheric transport

### Objective

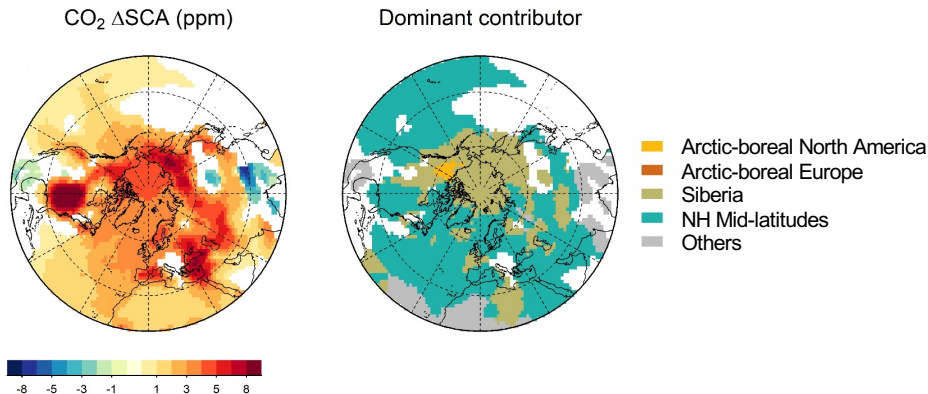
- Assess regional contributions to increasing CO<sub>2</sub> seasonal cycle amplitude (SCA)

### Methodology

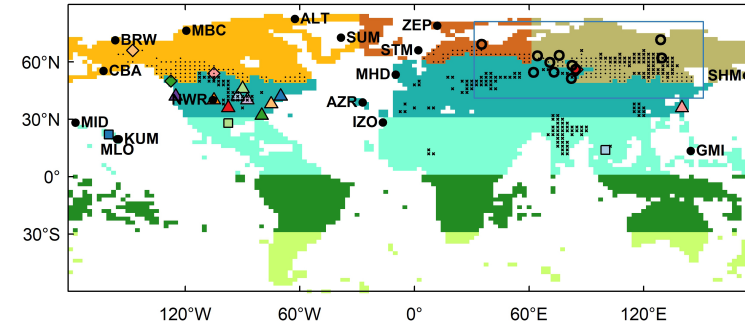
- Use a long-term CO<sub>2</sub> inversion product for surface fluxes (CAMS) and atmospheric transport model (GEOS-Chem)

### Results

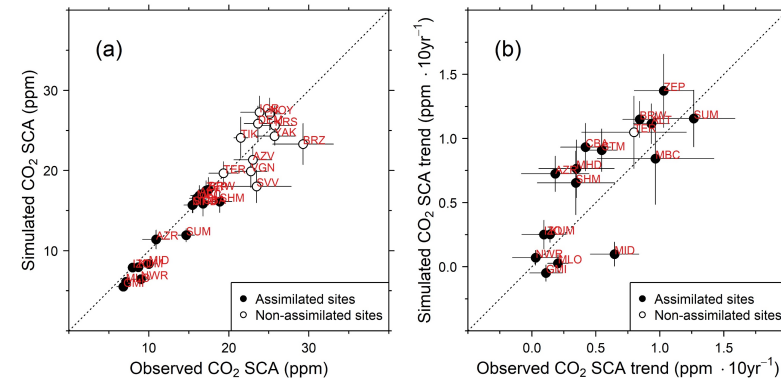
- The models adequately represent the magnitude, trend, and vertical gradient of the SCA at withheld observation sites
- Siberia dominates the increasing trends in SCA at the surface across the arctic-boreal zone (coinciding with widespread 'greening') (Lin et al., *in prep*)



Trend in SCA (1980-2017) at the surface and dominant contributing regions

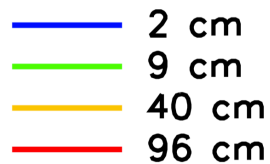


Regions used for tagged CO<sub>2</sub> tracer transport simulations (blue box represents validation sites for Eurasia/Siberia)



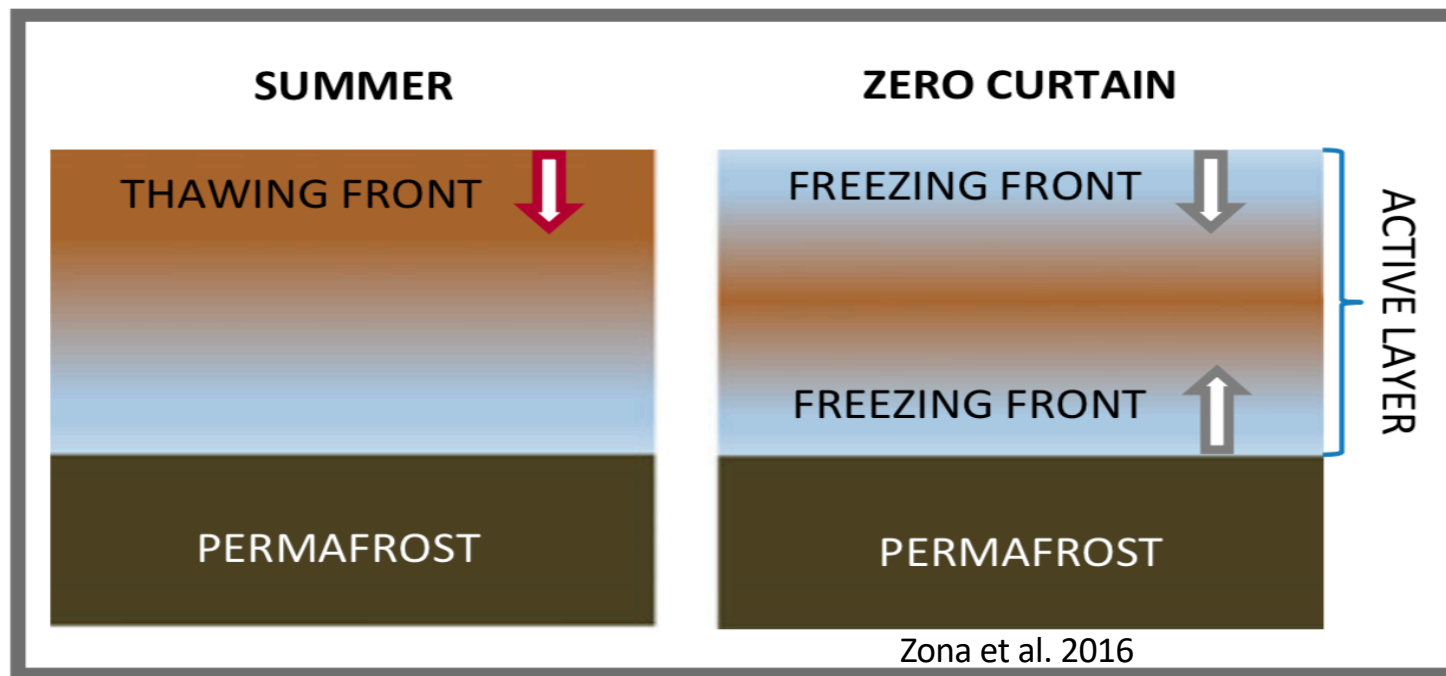
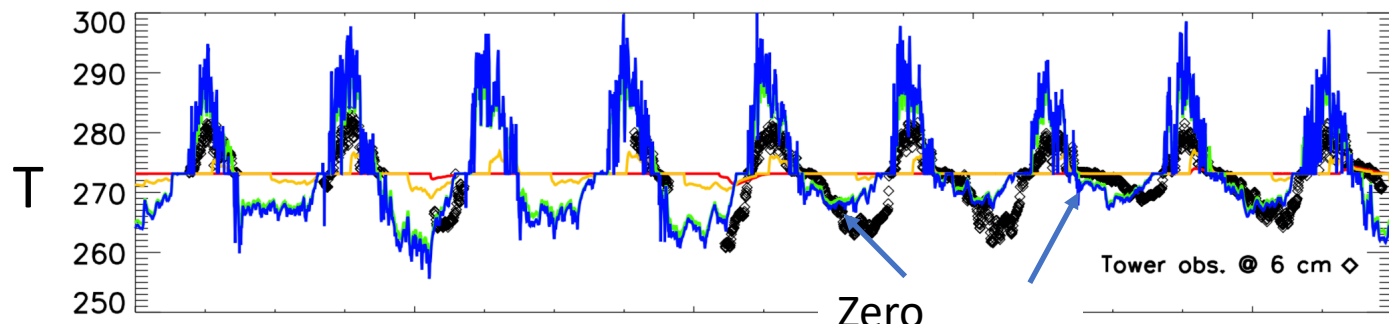
Model performance of CO<sub>2</sub> SCA and its trend at withheld validation sites across Eurasia and Siberia





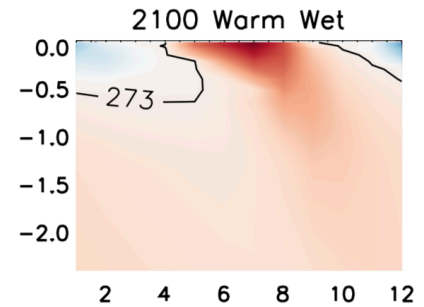
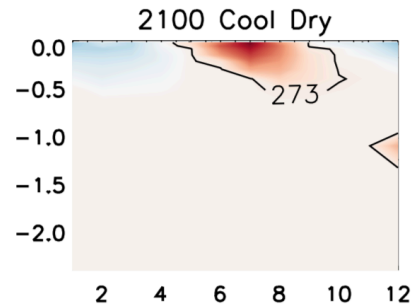
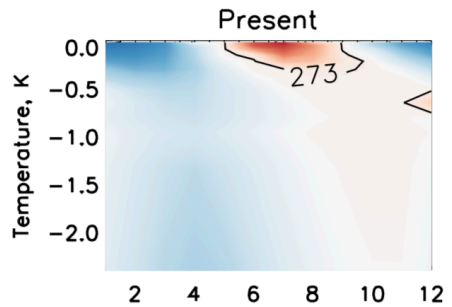
## Toolik Lake, AK tundra simulations

Vertically  
resolved,  
energy,  
moisture and  
respiration in  
ED2

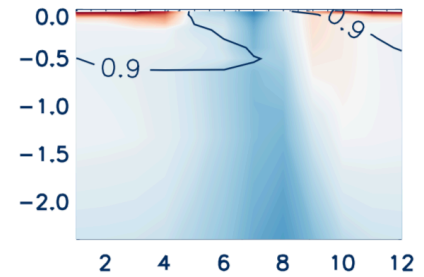
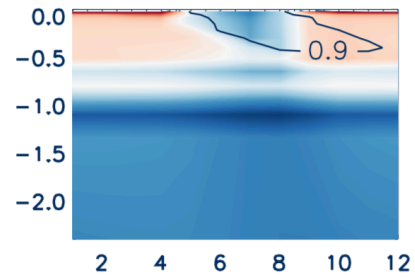
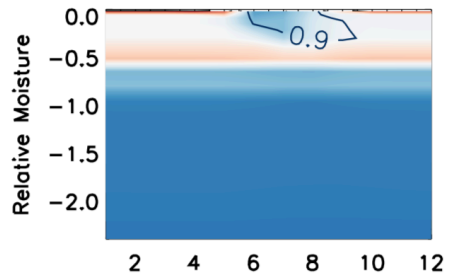




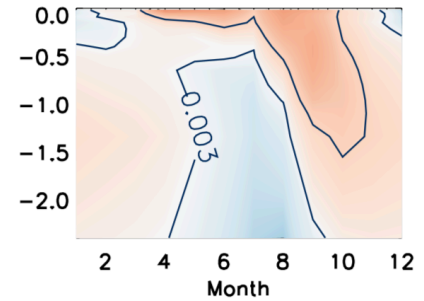
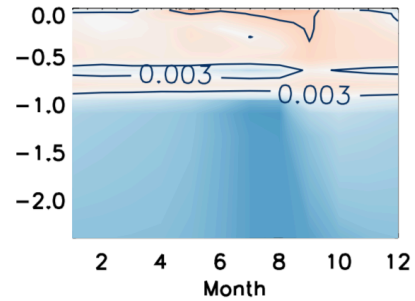
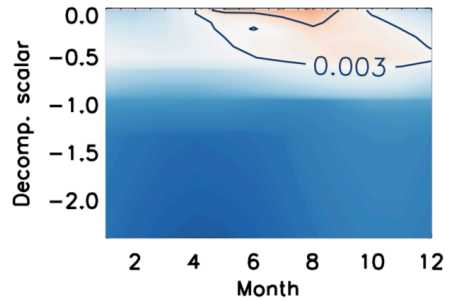
- Deepening of active layer and zero curtain extension later into the winter/spring.

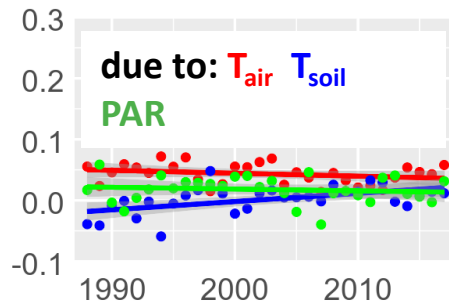
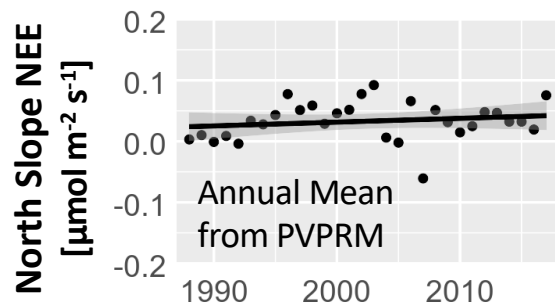


- Soil drying in the summer due to plant activity.



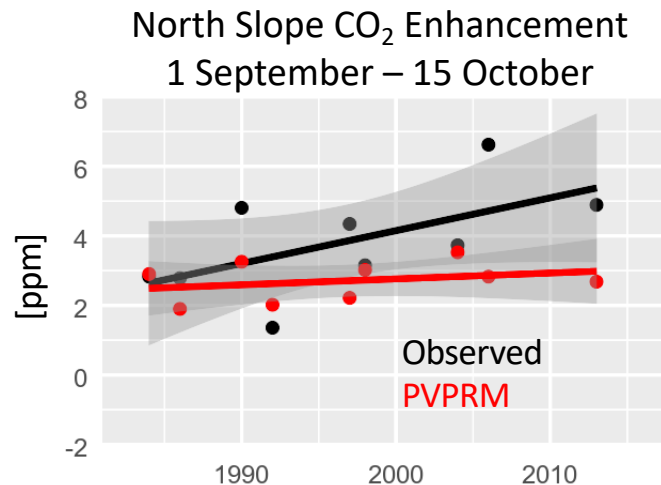
- Increased heterotrophic respiration in the fall/winter. Not in the summer – highlights need for year around measurements.





Simulated increased respiration from warmer soils is greater than increased uptake from warmer air temperatures.

Model underestimates observed increasing fall  $\text{CO}_2$  enhancement trend at Barrow.  
Could be driven by missing processes, namely soil moisture.



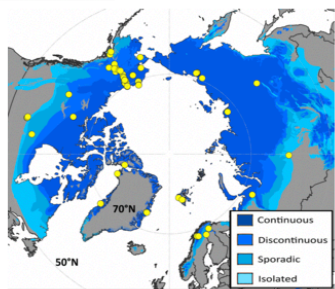
[Schiferl et al., in prep]

Munger-004 (Carbon 2016)



# Winter Respiration Group Update

S. Natali, J. Watts, C. Minions, S. Ludwig, B. Rogers, S. Goetz & Collaborators

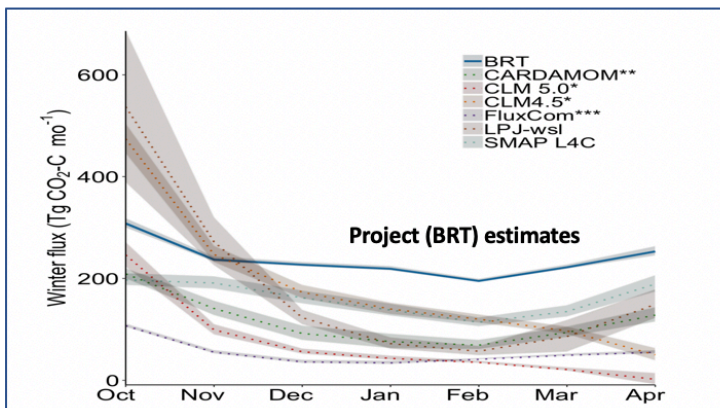


## Pan-Arctic Flux Synthesis

- New synthesized record of over 1,000 soil CO<sub>2</sub> observations from eddy covariance, chambers...
- Fluxes scaled to permafrost domain using remote sensing & Boosted Regression Trees (BRT); compared with process model estimates.
- **Flux observations and resulting 25 km (monthly) flux maps submitted to ORNL-DAAC.**

### Key findings:

- 1) pan-Arctic winter CO<sub>2</sub> emissions (2003 to 2017) avg. 1,662 Tg C year<sup>-1</sup>;
- 2) Fluxes of > 0.25 gC m<sup>-2</sup> day, even during cold (< -5°C) soil conditions;
- 3) Many process models underestimated CO<sub>2</sub> loss during the cold seasons, relative to *in situ* flux observations and BRT based estimates.

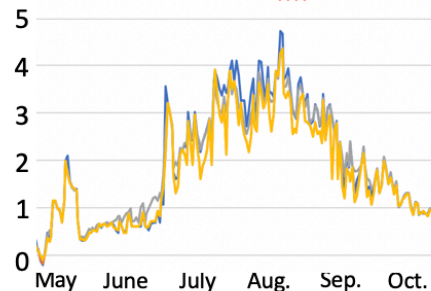


Natali, S., J.D. Watts, et al. (In Review)

## ABOVE Soil Respiration Stations (SRS)

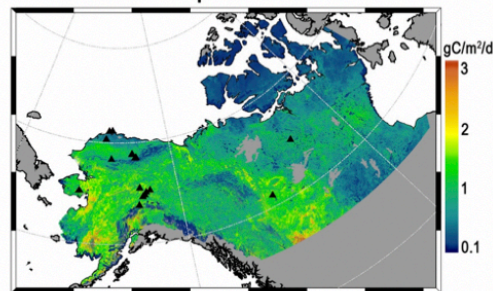


Bonanza Creek (gC m<sup>-2</sup> d<sup>-1</sup>)



- **New record (2016 to ≥ 2018) of hourly soil CO<sub>2</sub> flux from 11 sites in Alaska (1 in Canada),** obtained from forced diffusion chambers. Includes summer, shoulder and winter seasons. **Recently submitted to ORNL DAAC.**
- The SRS database includes hourly soil temperature (5, 15, 25, 50 cm depths) and soil moisture at 15 cm depth; daily site photos; snow depth; active layer.

September

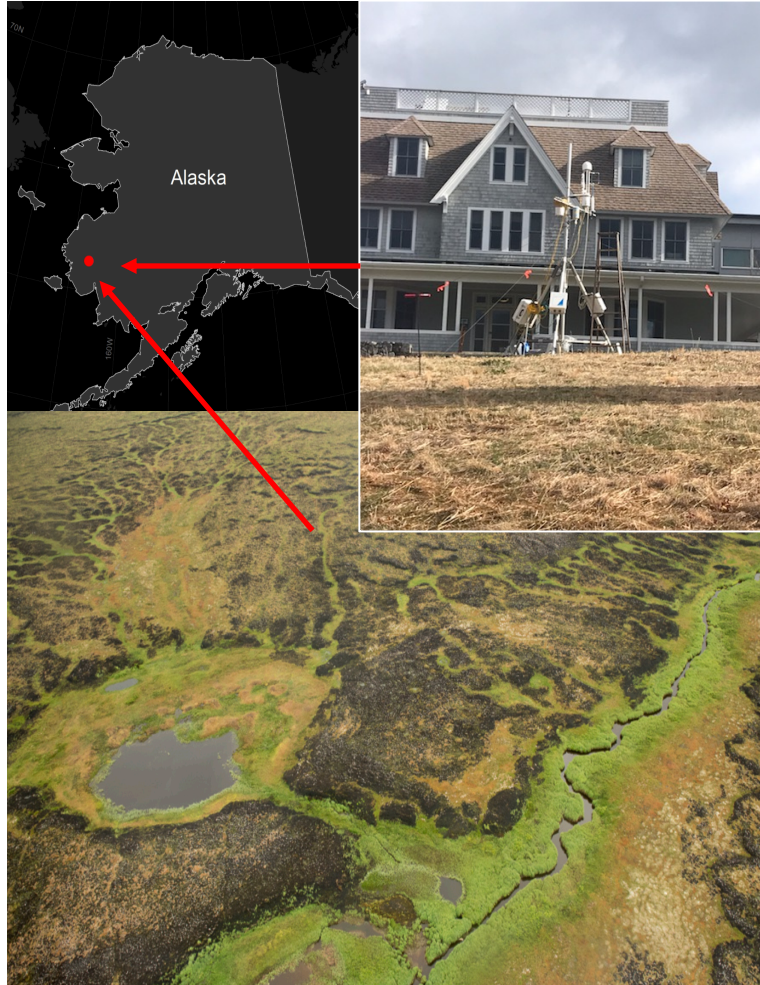


- The SRS fluxes + eddy covariance used with remote sensing & machine learning to produce **monthly flux maps at 300 m res for ABOVE domain.**
- **ABOVE cold season flux budget (Sept. though Mar.) ~ 140 Tg C (2016/2017)**

# New Eddy Covariance Tower in Yukon-Kuskokwim Delta



PI: Sue Natali (WHRC)



- New flux tower ( $\text{CO}_2$ ,  $\text{CH}_4$ ) sponsored by WHRC will be installed summer 2019.
- Chamber fluxes also planned in burned (2015 fire) and unburned tundra.
- Observations will provide important validation for models and airborne.

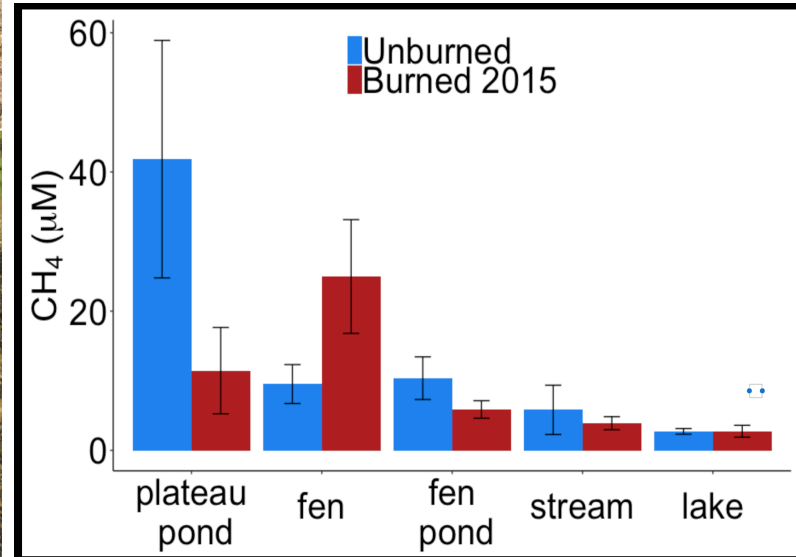
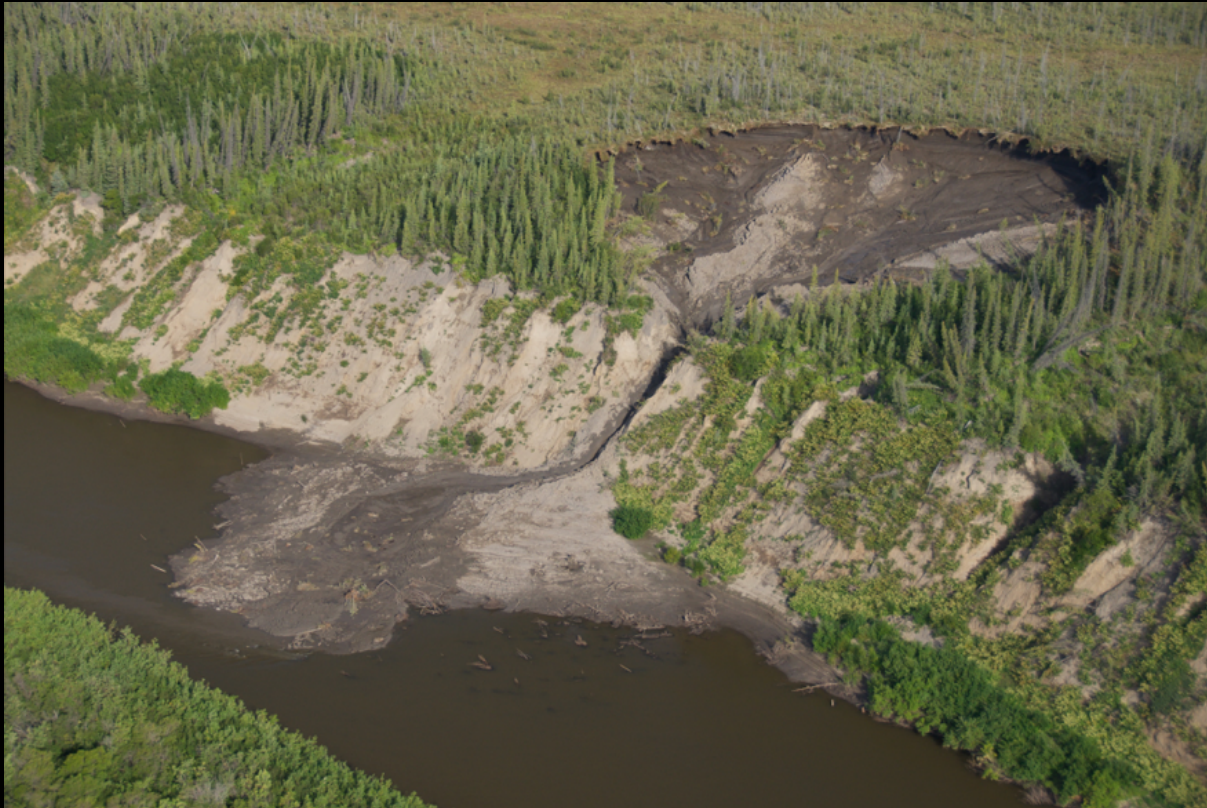


Figure from S. (Ludda) Ludwig



*In prep (during sabbatical!!)*

- Impacts of permafrost slumping along the Old Crow River, Yukon
- Evaluating sources for river carbon export from Old Crow Flats, Yukon using  $\delta^{13}\text{C}$



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- Impacts of permafrost slumping along the Old Crow River, Yukon
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Completed analyses

- UAV surveys and volumetric analysis of slump 2016-18
- Slump sediment C, N, bulk density analyses
- Lake and river water C (DIC, DOC) concentration and  $\text{d}^{13}\text{C}$  analyses across 14 lakes and 24 river and creek sites

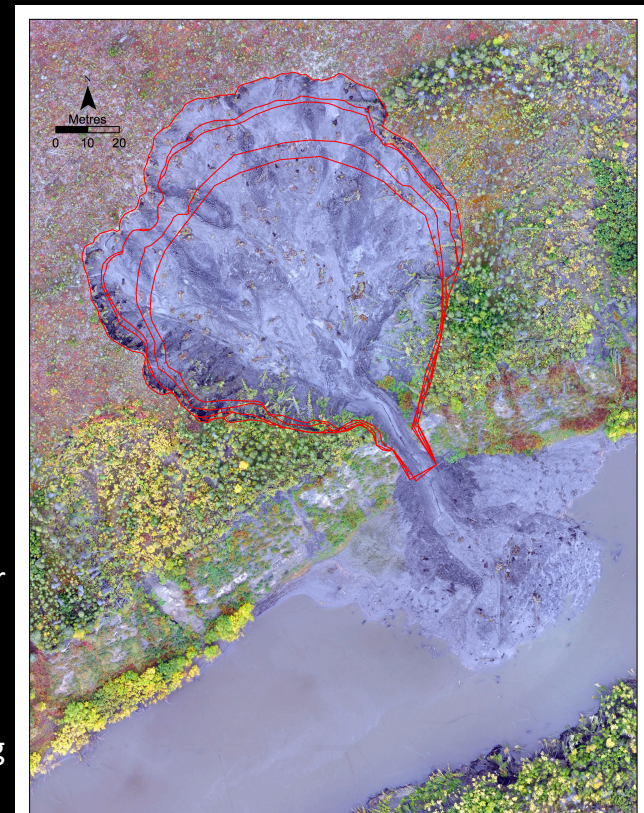
Fieldwork

June and August 2018:

- Water sampling lakes and rivers for isotope and other biogeochemical analyses
- UAV surveys at Zelma Lake, permafrost slump and burn

June 2019:

- UAV inventories of permafrost slumping along Old Crow River
- Slump sediment sampling for C analyses
- Water sampling lakes and rivers for isotope and other biogeochemical analyses
- Lake sediment coring to reconstruct lake responses (including C) to changing catchment characteristics





## Summary

- “How are the magnitudes, fates, and land-atmosphere exchanges of carbon pools responding to environmental change, and what are the biogeochemical mechanisms driving these changes?”
- CDWG must continue - Phase 2 and beyond
- Looking forward (2019-2020 strategic plan): rescope coordination & synthesis activities (**discussion topic for today’s breakout**), projects & WG need to be updated, synergy with PCN/SEARCH, NGEE-Arctic, IARPC

## ABoVE Projects with CD Component

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